

## **UWB Tracking Algorithms – AOA and TDOA**

### **Abstract**

Ultra-Wideband (UWB) tracking prototype systems are currently under development at NASA Johnson Space Center for various applications on space exploration. For long range applications, a two-cluster Angle of Arrival (AOA) tracking method is employed for implementation of the tracking system; for close-in applications, a Time Difference of Arrival (TDOA) positioning methodology is exploited. Both AOA and TDOA are chosen to utilize the achievable fine time resolution of UWB signals.

This talk presents a brief introduction to AOA and TDOA methodologies. The theoretical analysis of these two algorithms reveal the affecting parameters' impact on the tracking resolution. For the AOA algorithm, simulations show that a tracking resolution less than 0.5% of the range can be achieved with the current achievable time resolution of UWB signals. For the TDOA algorithm used in close-in applications, simulations show that the (sub-inch) high tracking resolution is achieved with a chosen tracking baseline configuration. The analytical and simulated results provide insightful guidance for the UWB tracking system design.

# UWB Tracking Algorithms AOA and TDOA



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*\*This research was performed while the PI held a National Research Council  
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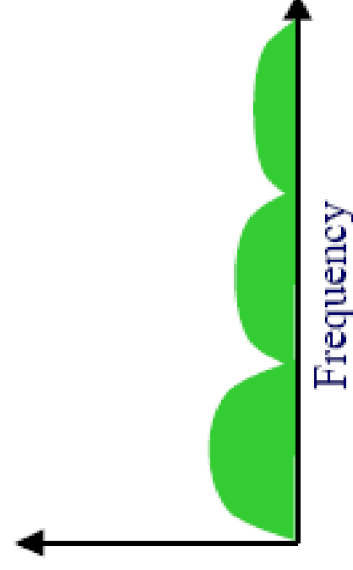
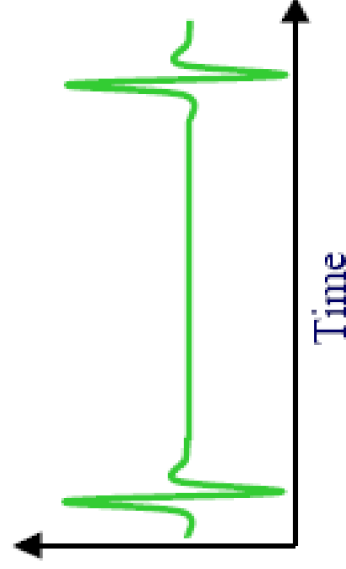
# Outline

- UWB Tracking Algorithm Introduction
- AOA Tracking Methodology
- AOA Resolution Analysis and Simulations
- TDOA Tracking Methodology
- TDOA Resolution Analysis and Simulations
- Conclusion and Future Work

# Motivation

(UWB Fine Time Resolution to Precise Tracking)

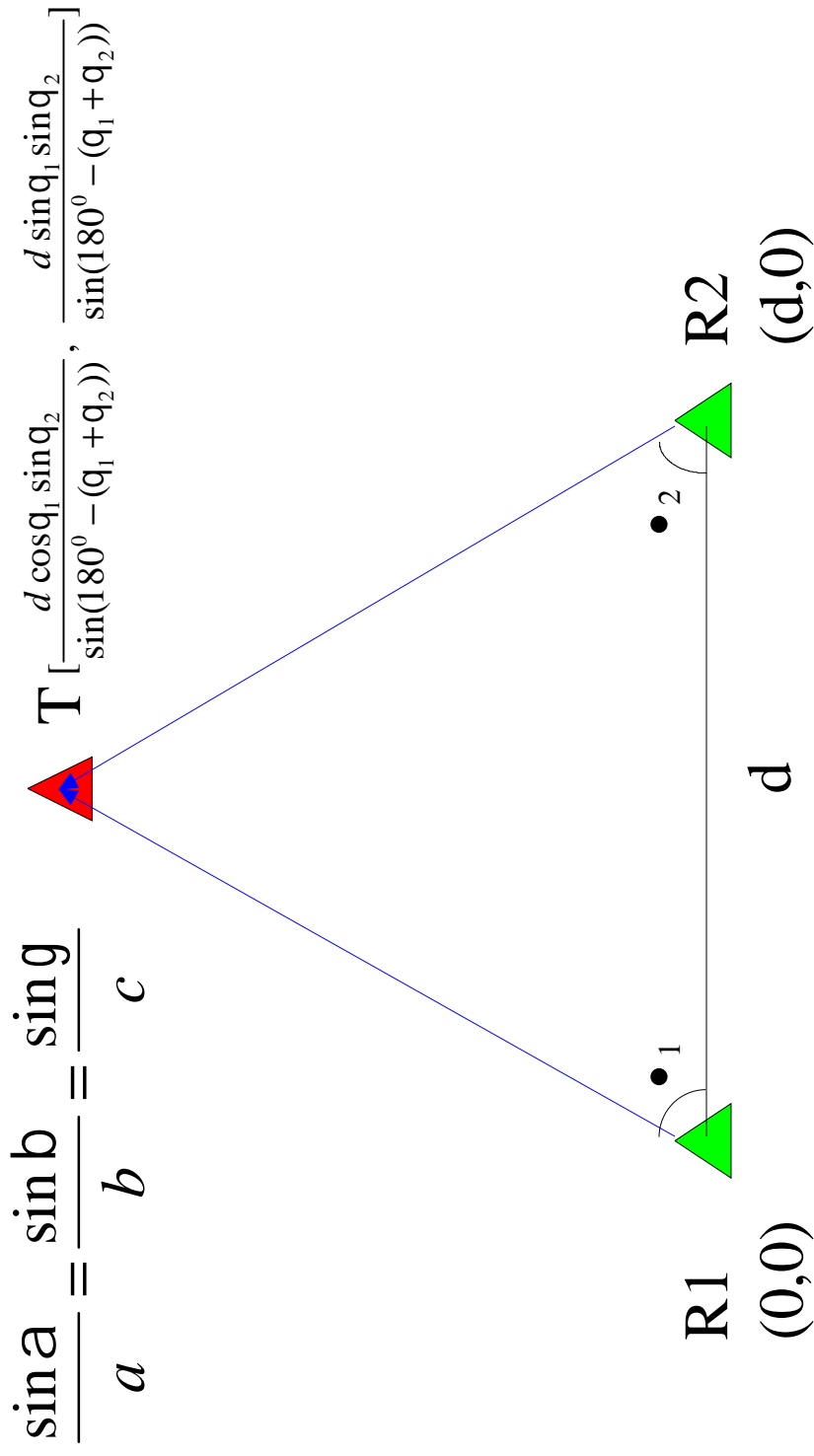
## Impulse, Ultra-Wideband



- $1 \text{ ns} \rightarrow 1 \text{ foot}$ ,  $3 \text{ ps} \rightarrow 1 \text{ mm}$  (ranging, linear)
- Tracking (positioning in 2D/3D) resolution (nonlinear) ?
- Long Range application: AOA (Angle of Arrival)
- Proximity Application: TDOA (Time Difference of Arrival)

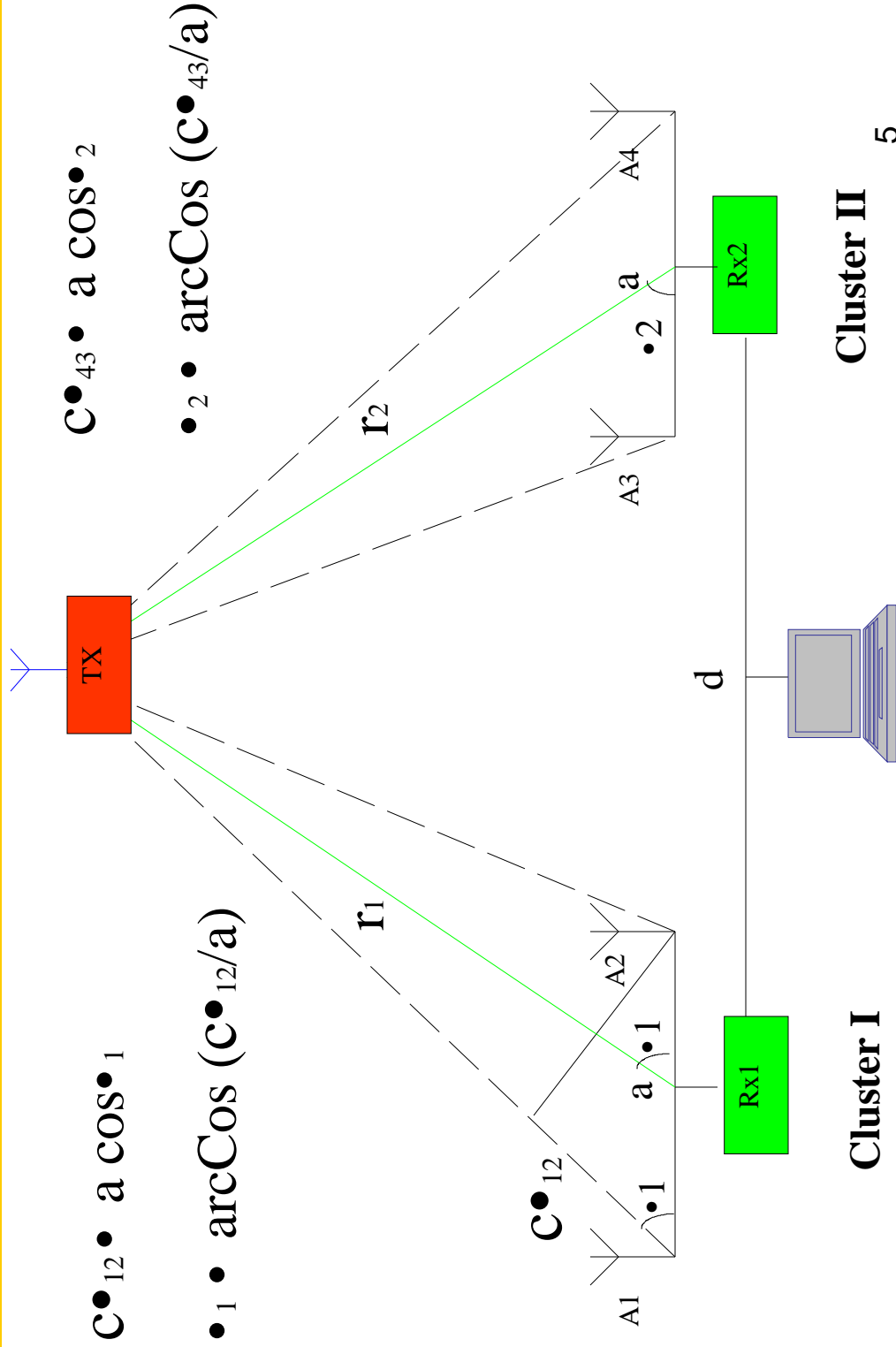


# Angle of Arrival (AOA)





# Two Cluster Design





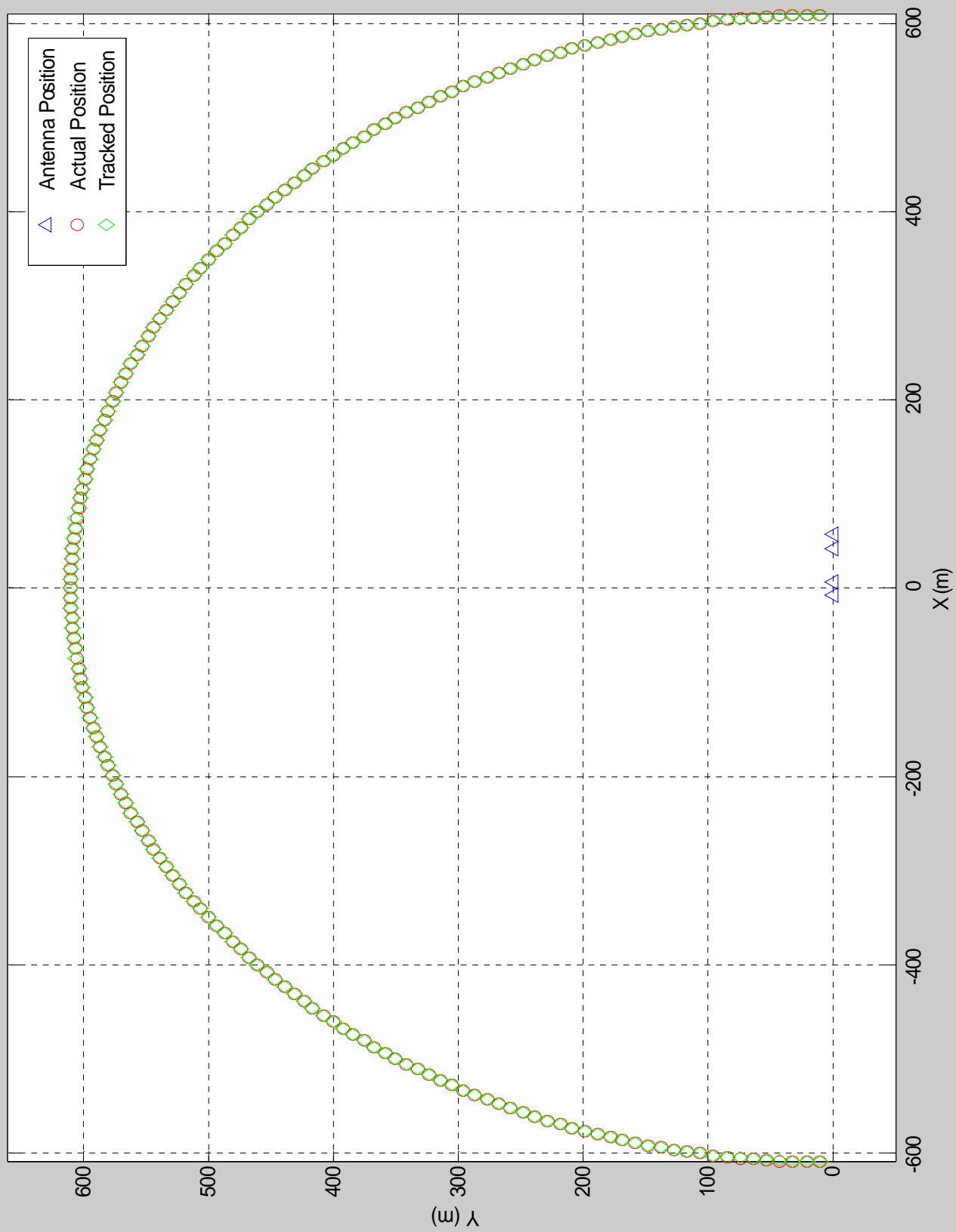
# **Tracking Simulation**

Perfect TDOA Information

## **Default Setting:**

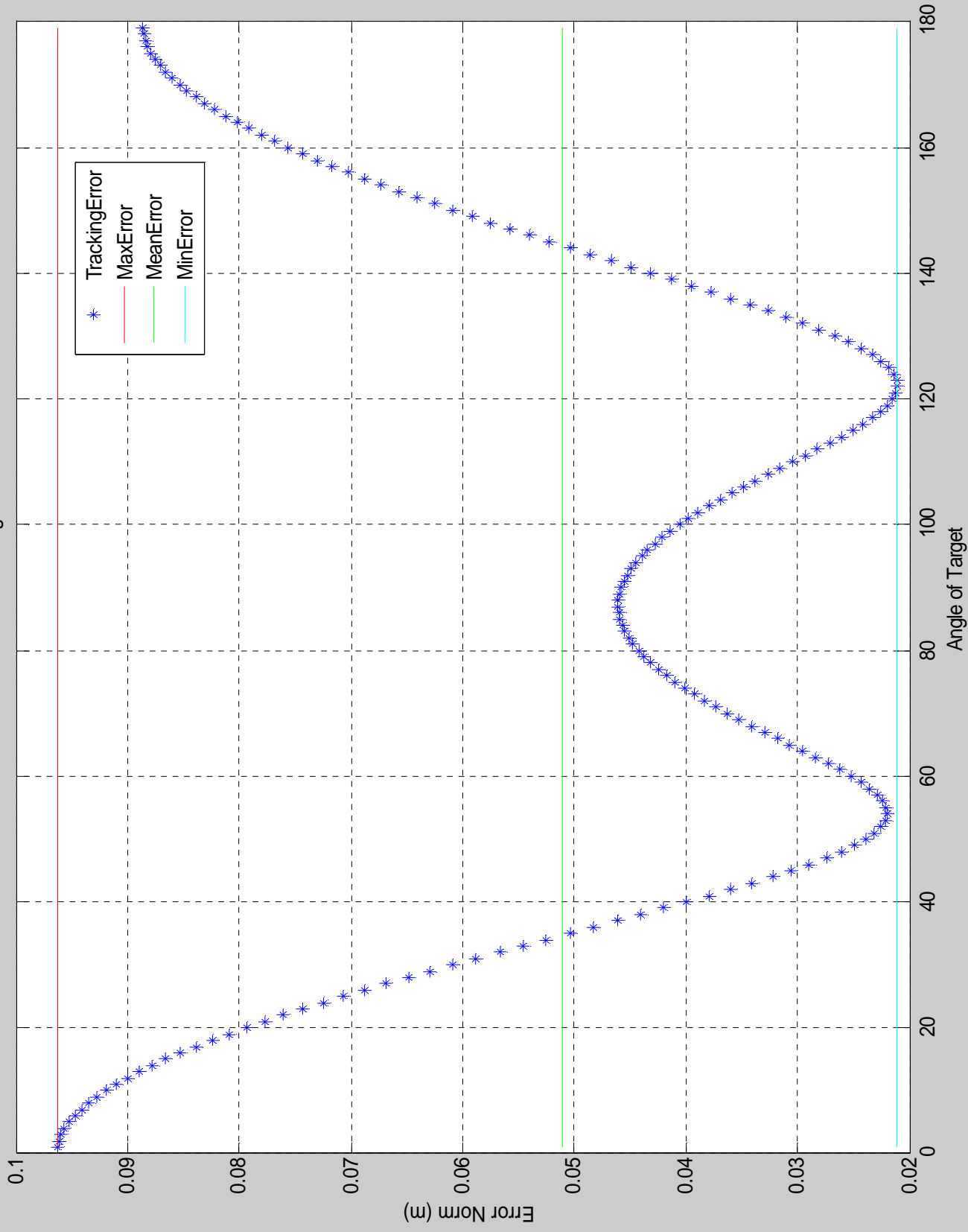
- Cluster Size  $a=15$  meters
- Baseline Size  $d=50$  meters
- Tracking Range  $r=610$  meters (2000 feet)
- Tracking Angle  $\bullet = 0 \sim 180$  degree

Two-Cluster-AOA-Tracking (perfect TDOA)





Resolution vs. Angle





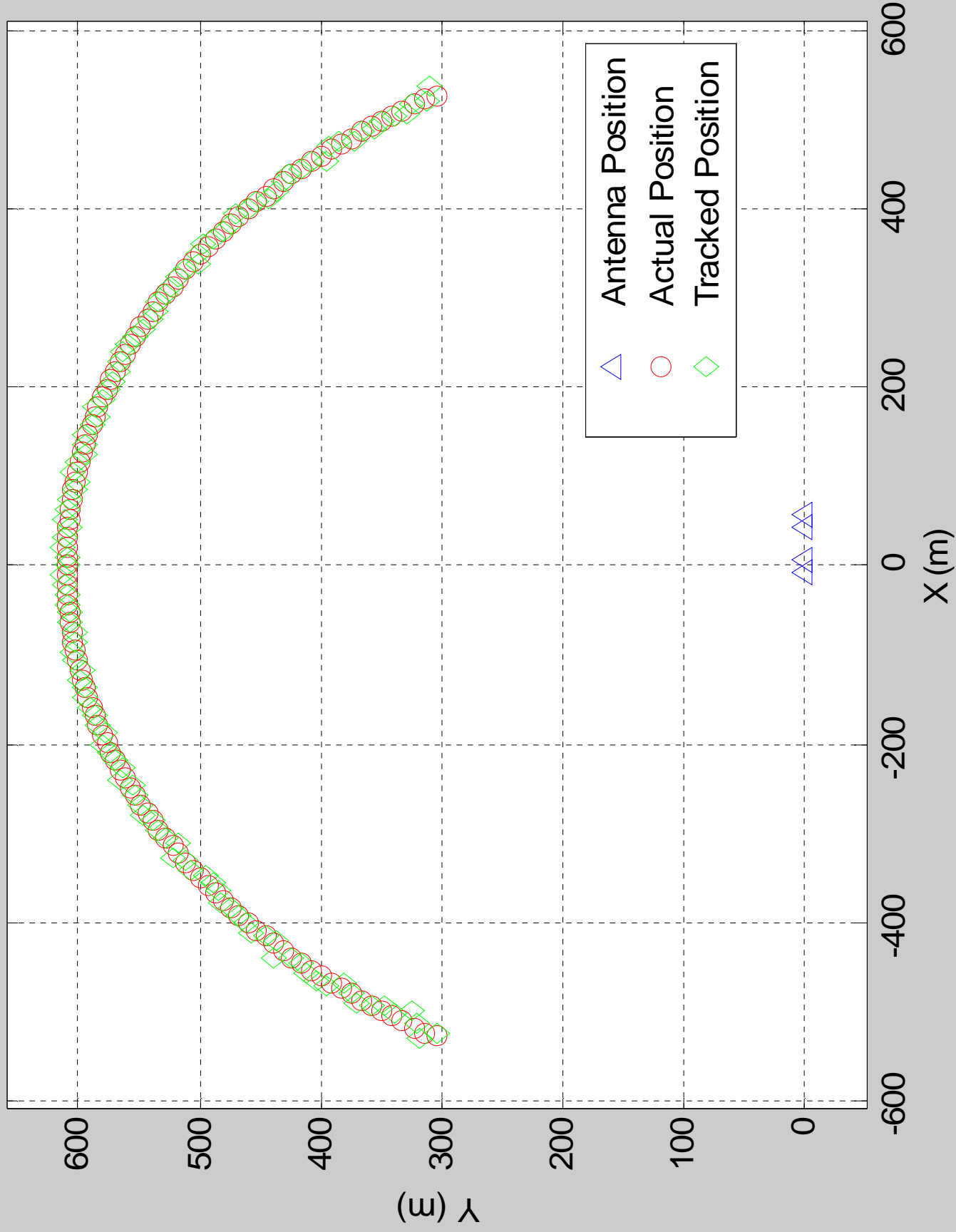
# Tracking Simulation

## Noisy TDOA Information

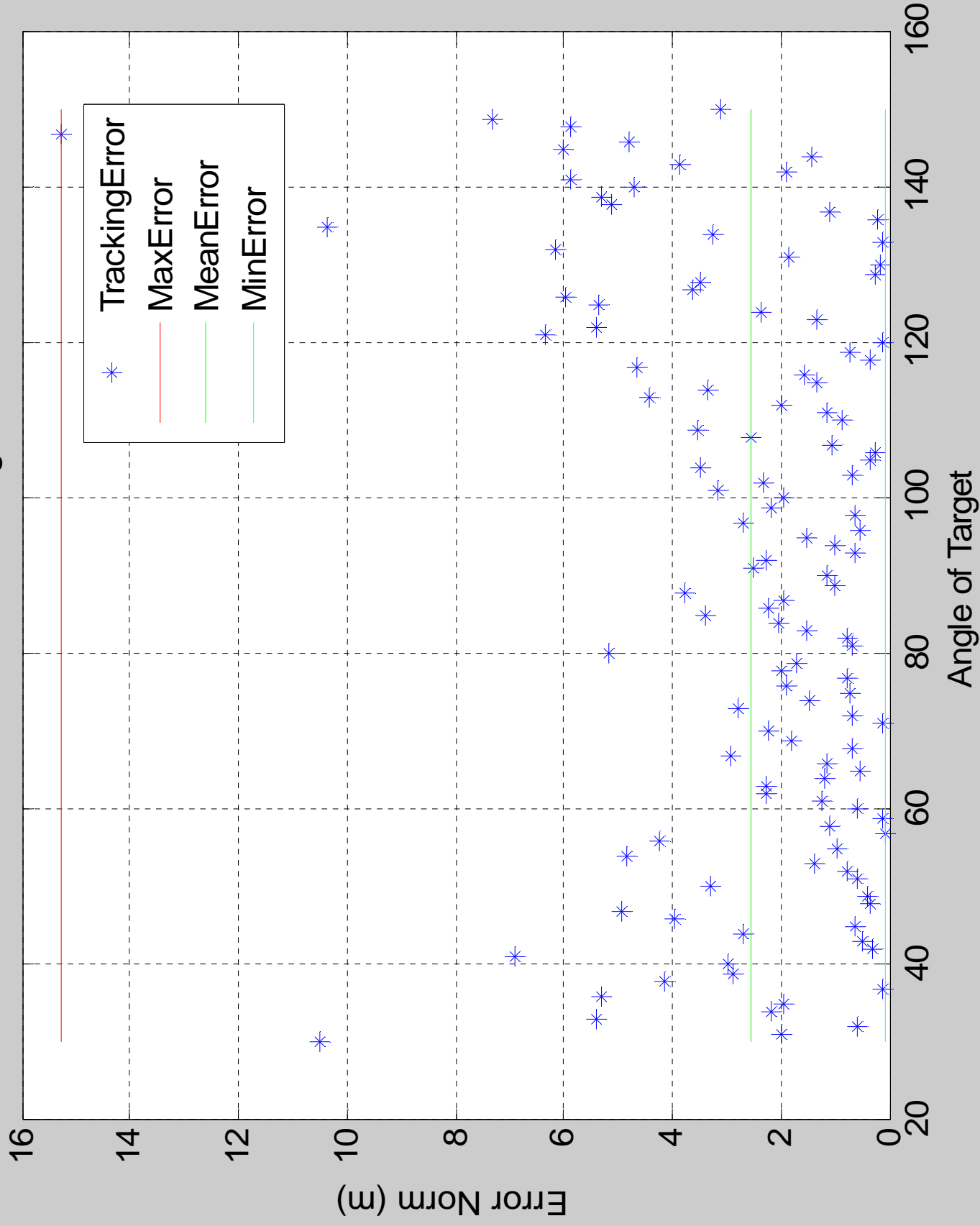
### Default Setting:

- Cluster Size  $a=15$  meters
- Baseline Size  $d=50$  meters
- Tracking Range  $r=610$  meters (2000 feet)
- Tracking Angle •  $\pm 30 \sim 150$  degree
- TDOA Noise Level       $=10$  picoseconds

Two-Cluster-AOA-Tracking (noisy TDOA)



Resolution vs. Angle





# Resolution vs. Affecting Parameters

$$\text{MSE} = f(a, d, \mathbf{r}, S)$$

$a$  – cluster size (distance between two antennas)

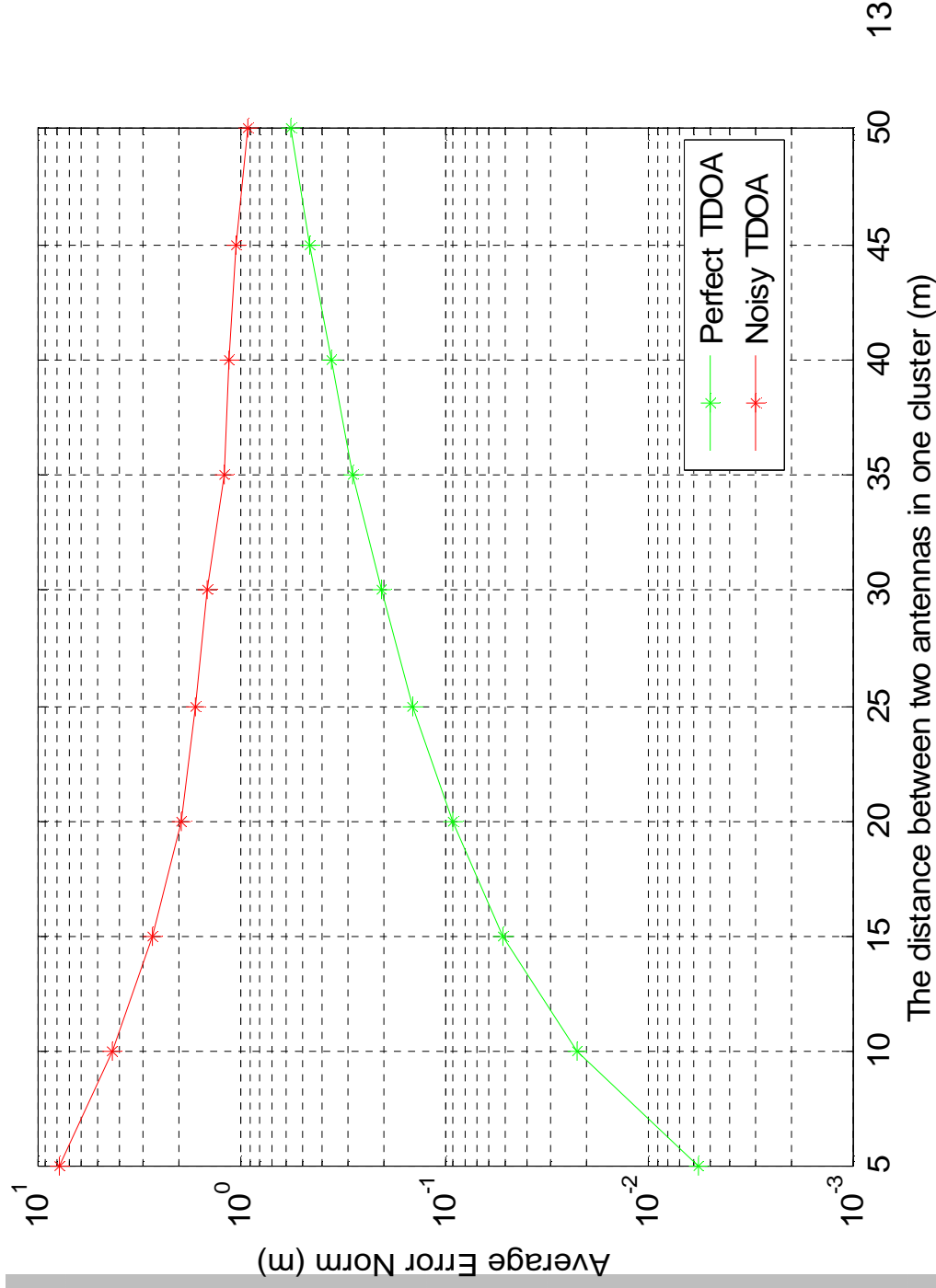
$d$  – baseline size (distance between two receivers)

$\mathbf{r}$  – tracking range (distance from target to origin, angle)

$S$  – TDOA noise level (standard derivation of TDOA)

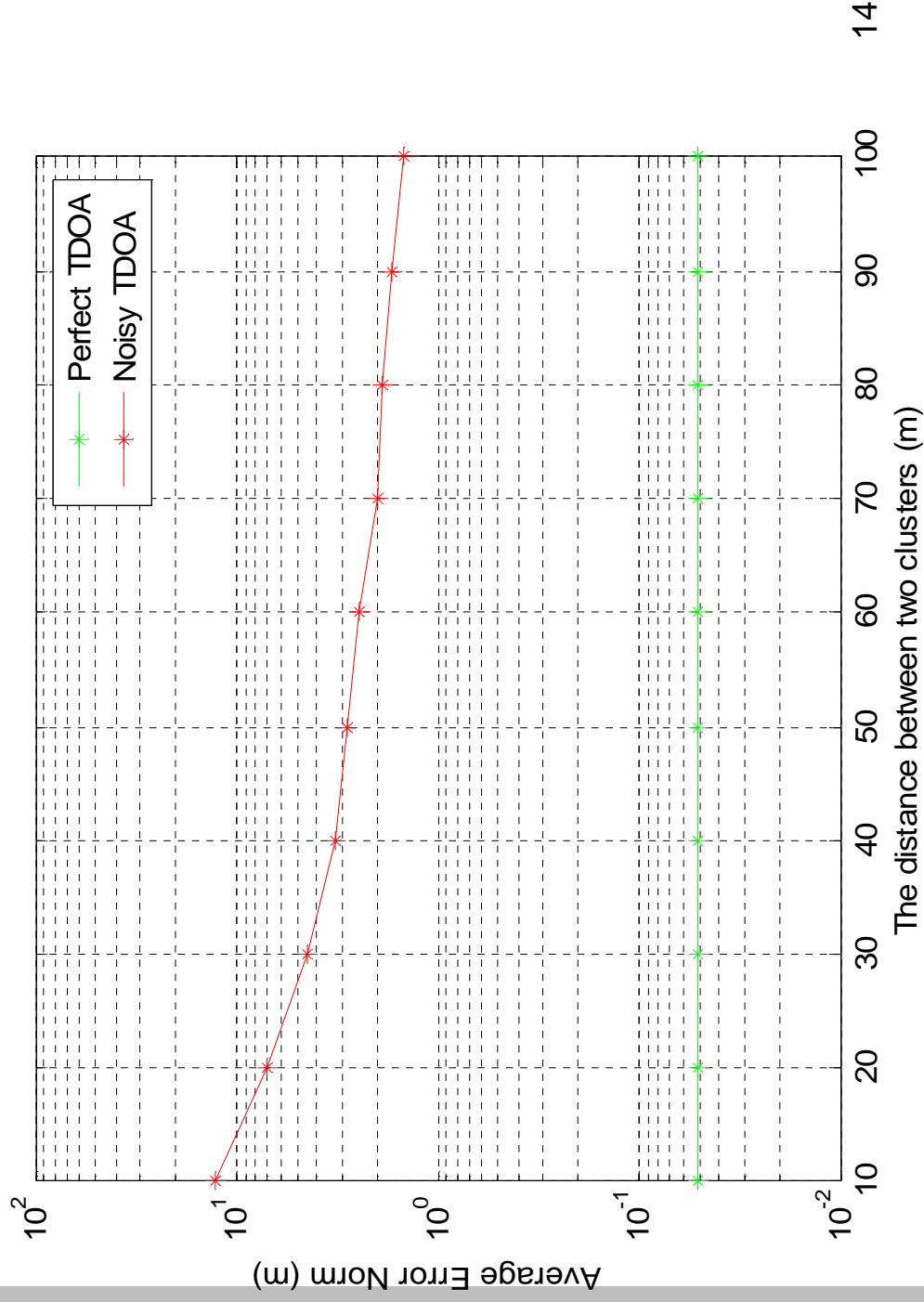


# Resolution vs. Cluster Size



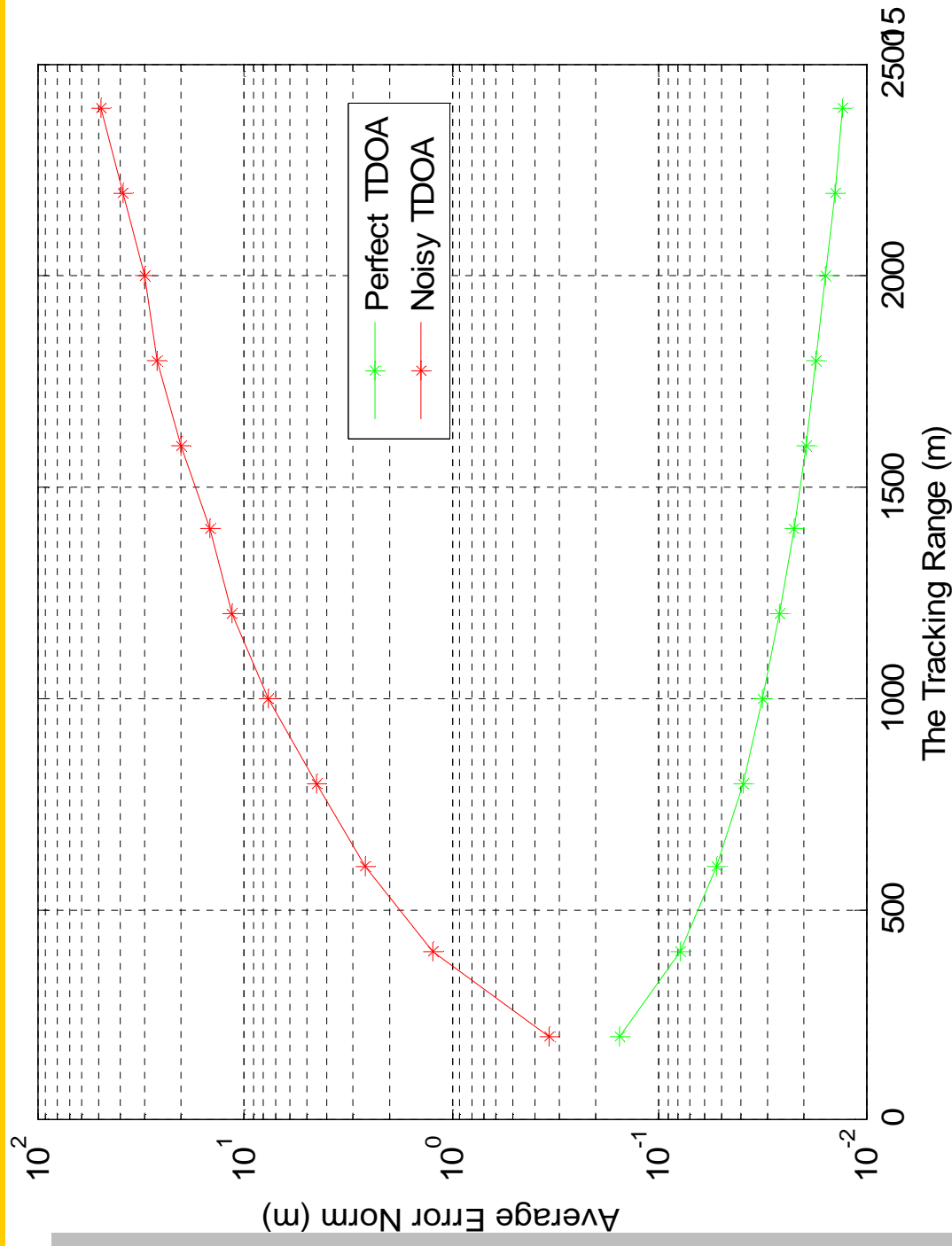


# Resolution vs. Baseline Size





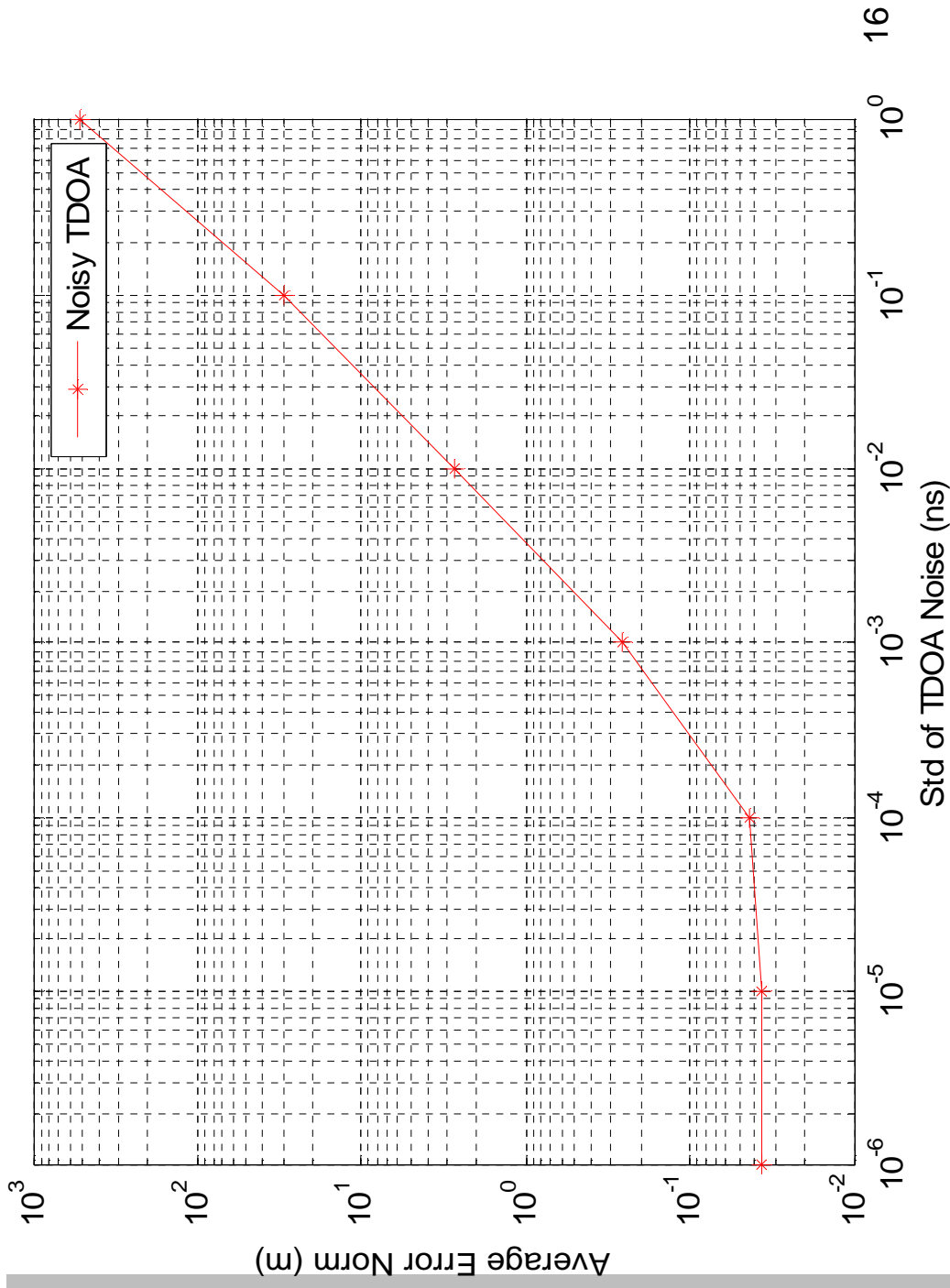
# Resolution vs. Range







# Resolution vs. TDOA Noise



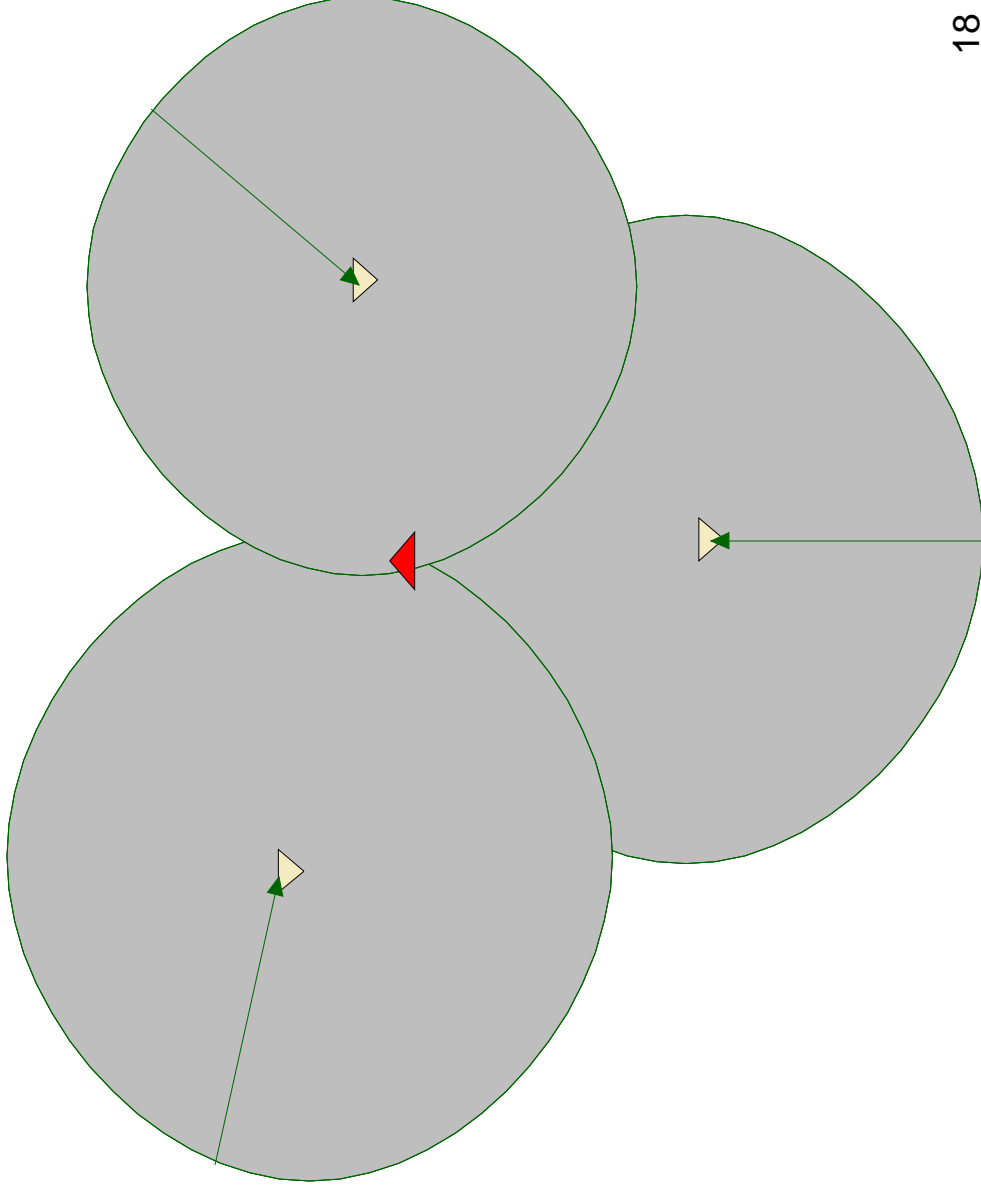


# AOA Summary

- Analysis shows that AOA algorithm can achieve fine tracking resolution using TDOA estimates with low noise level
- Analysis provides guidance for system design to improve the tracking resolution
- To increase the cluster size
- To decrease the noise level of TDOA estimates (hardware/DSP techniques)



# Time of Arrival (TOA)





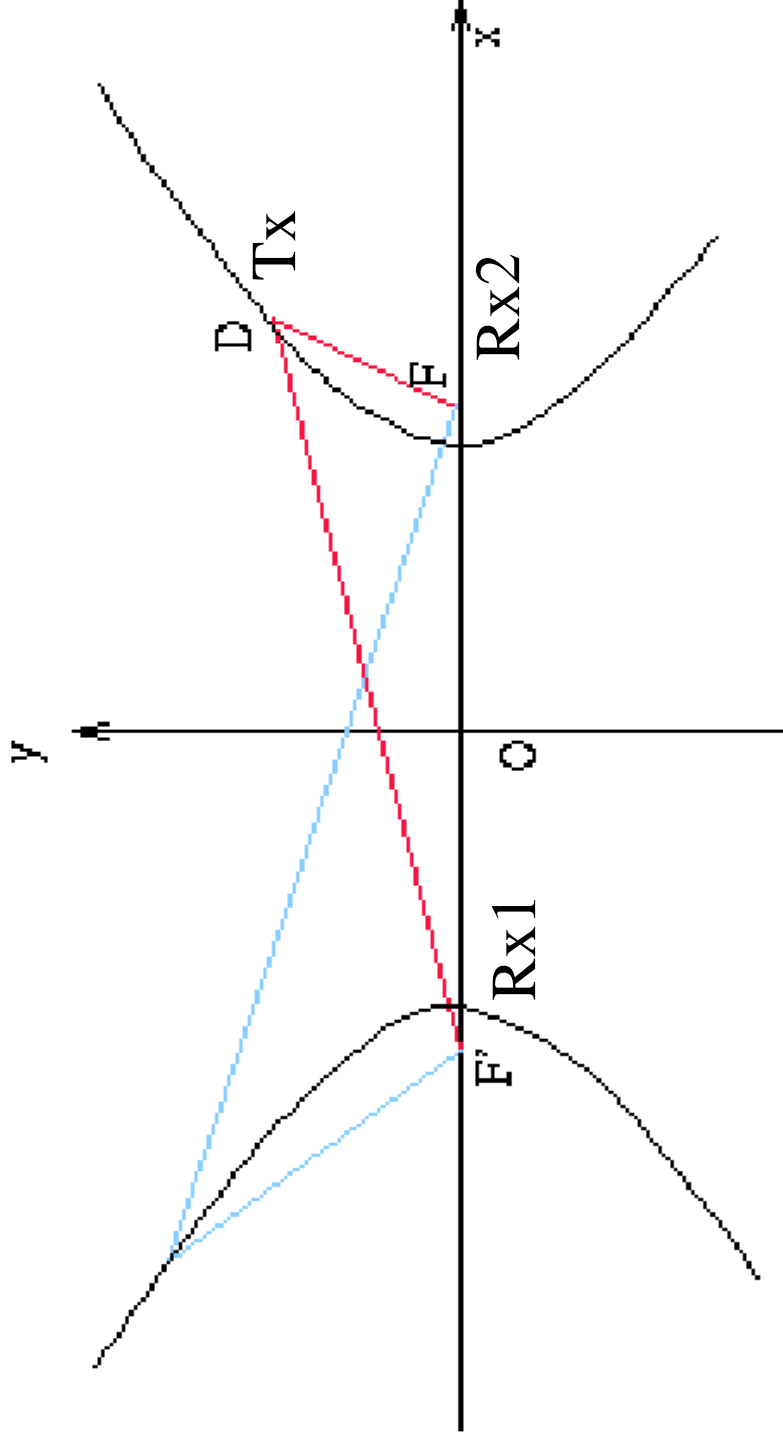
# Drawbacks of TOA

- Ranging: requires duplex transmission and incurs overhead (Asynchronization)
- Synchronization: hard to achieve the synchronization precision between the transmitter and receiver ; 1microsecond synchronization error can easily translate into 300 meters of range error



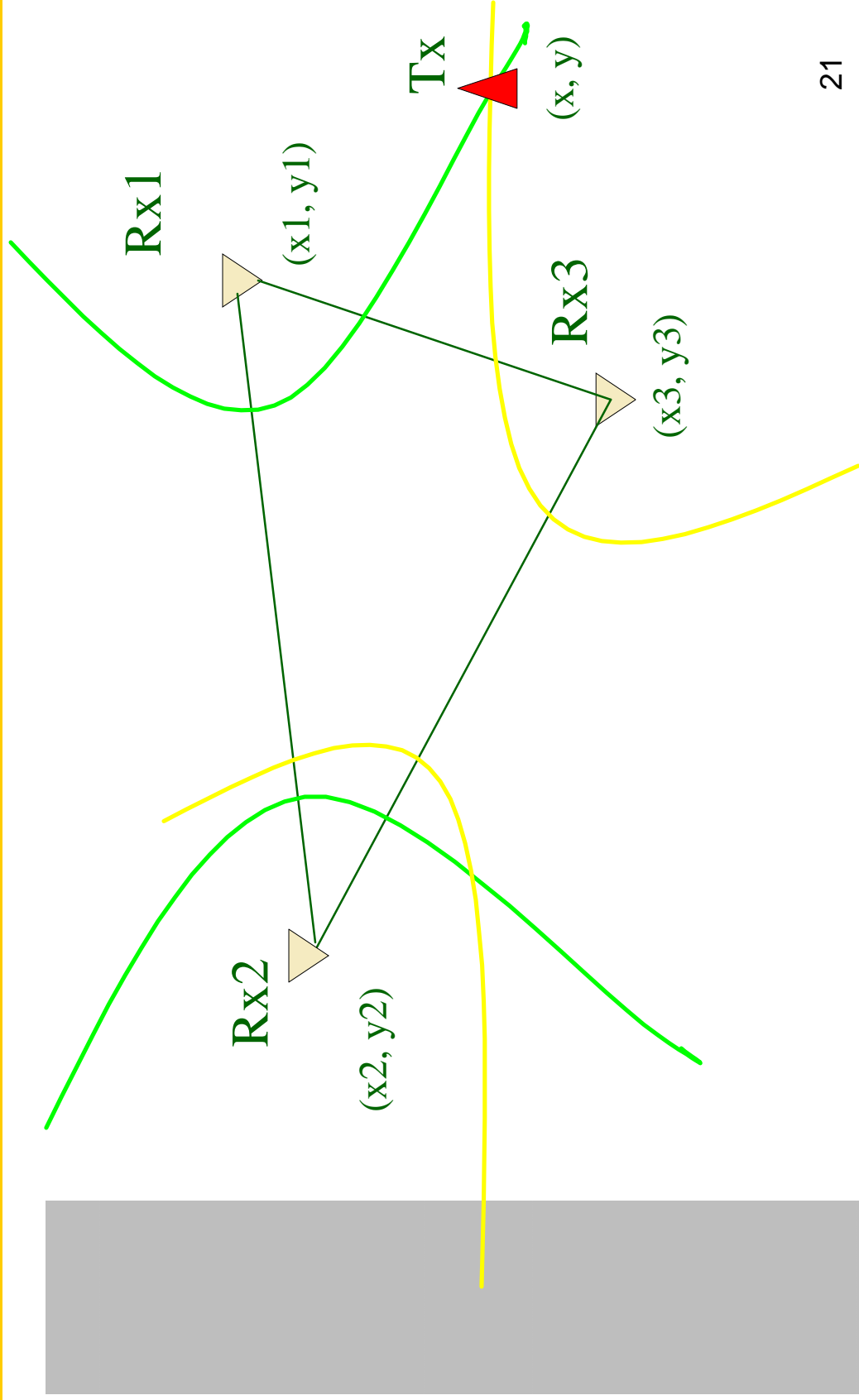
# Time Difference of Arrival (TDOA)

Hyperbola:  $b^2 x^2 - a^2 y^2 = a^2 b^2$





# Time Difference of Arrival (TDOA)





# Advantages of TDOA

- No synchronization between Tx and Rx
- Simplex (one-way) data estimation
- Cross-correlation works well to obtain TDOA



# TDOA Equations (2D)

$$D_{12} = \sqrt{(x_1 - x)^2 + (y_1 - y)^2} - \sqrt{(x_2 - x)^2 + (y_2 - y)^2} = t_{12}c$$

$$D_{13} = \sqrt{(x_1 - x)^2 + (y_1 - y)^2} - \sqrt{(x_3 - x)^2 + (y_3 - y)^2} = t_{13}c$$

$$D_{23} = \sqrt{(x_2 - x)^2 + (y_2 - y)^2} - \sqrt{(x_3 - x)^2 + (y_3 - y)^2} = t_{23}c$$



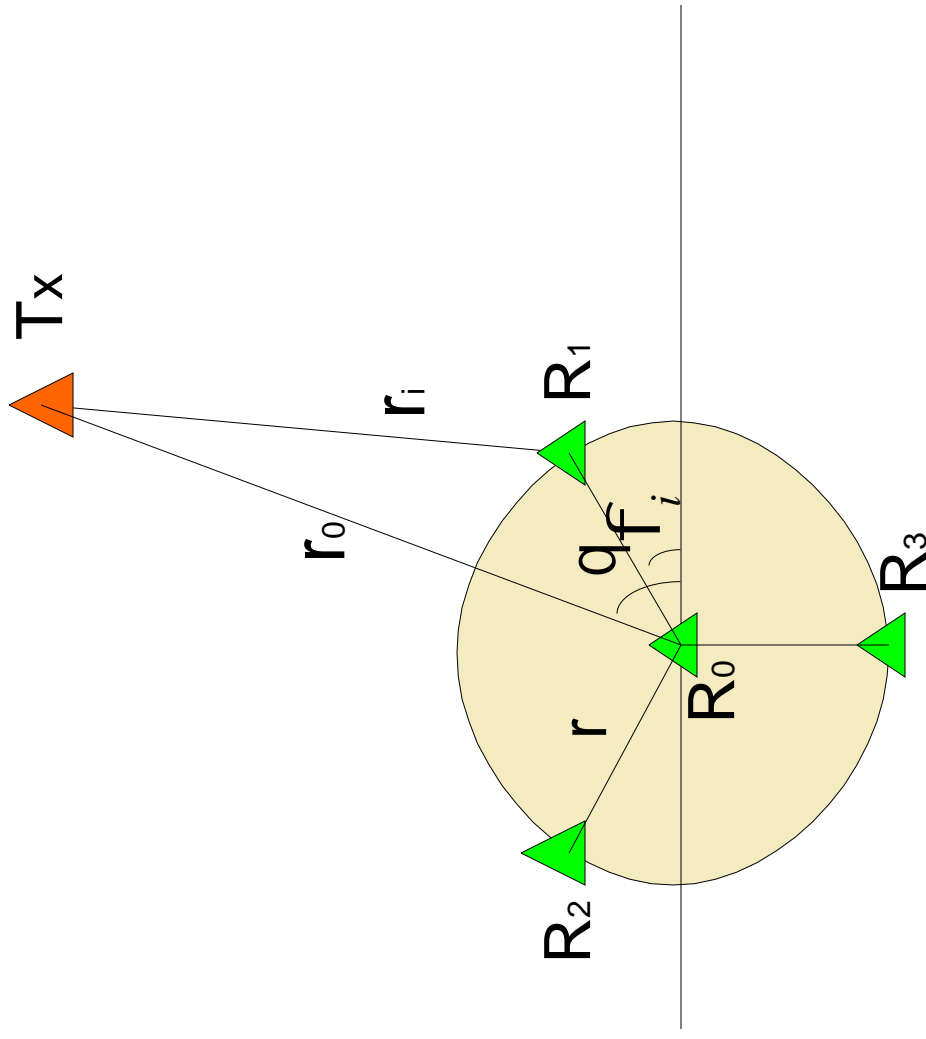


# TDOA Algorithm

- Taylor Series Expansion Least Squares Iterative Algorithm  
(Initialization problem and convergence problem)
- Two-Stage Weighted Least Squares Algorithm  
(one more receiver)



# Resolution Analysis (setting)





# Resolution Analysis (MSE)

$$\text{MSE} = \frac{c^2 S^2 r_0^2 \sum_{i=1}^3 (a_i^2 + b_i^2)}{r^2 \left( \sum_{i=1}^3 a_i^2 \sum_{i=1}^3 b_i^2 - \left( \sum_{i=1}^3 a_i b_i \right)^2 \right)}$$

$$a_i = \cos f_i + \frac{r_i - r_0}{r} \cos q$$

$$b_i = \sin f_i + \frac{r_i - r_0}{r} \sin q$$

$$r_i = \sqrt{r_0^2 + r^2 - 2r_0 r \cos(q - f_i)}$$

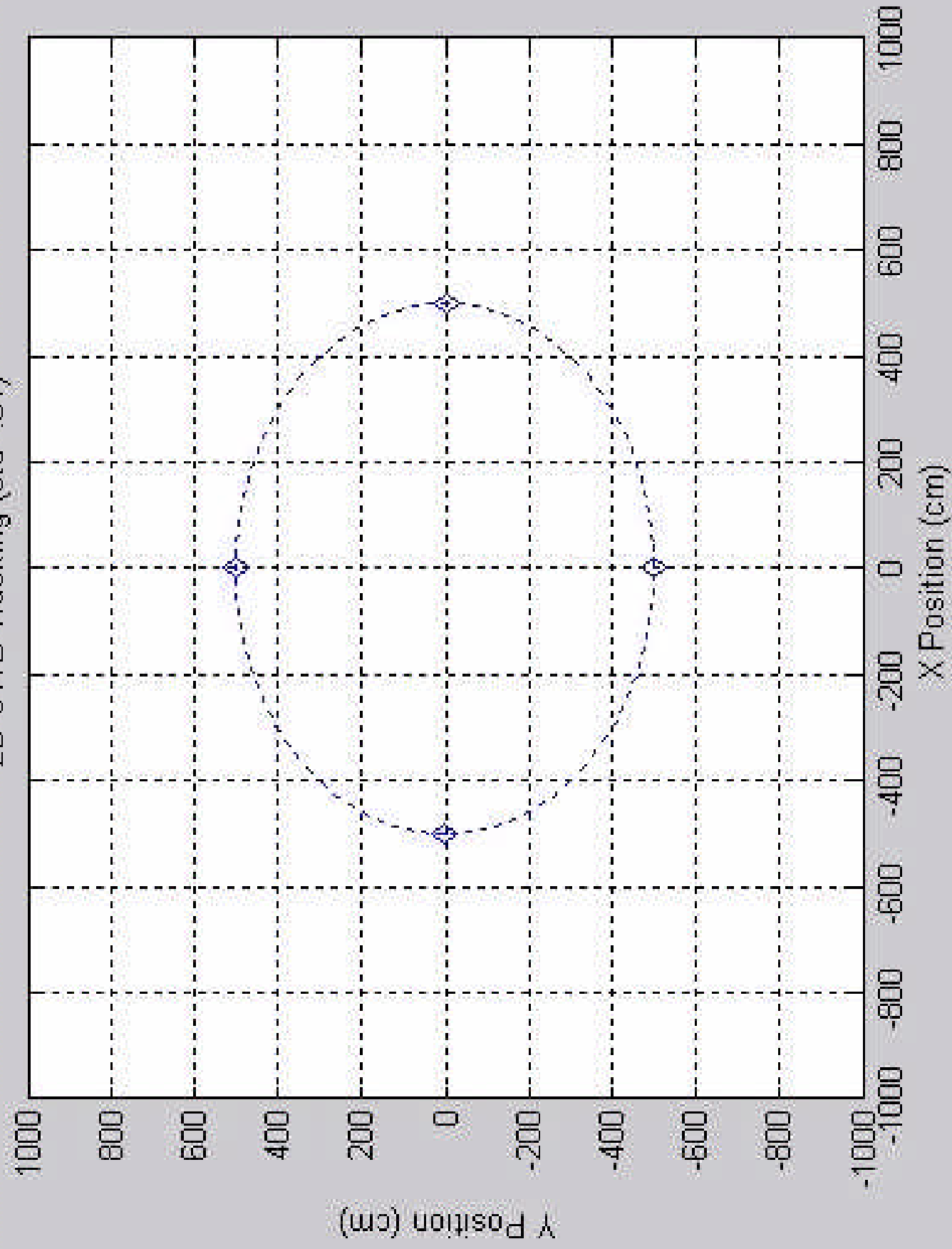


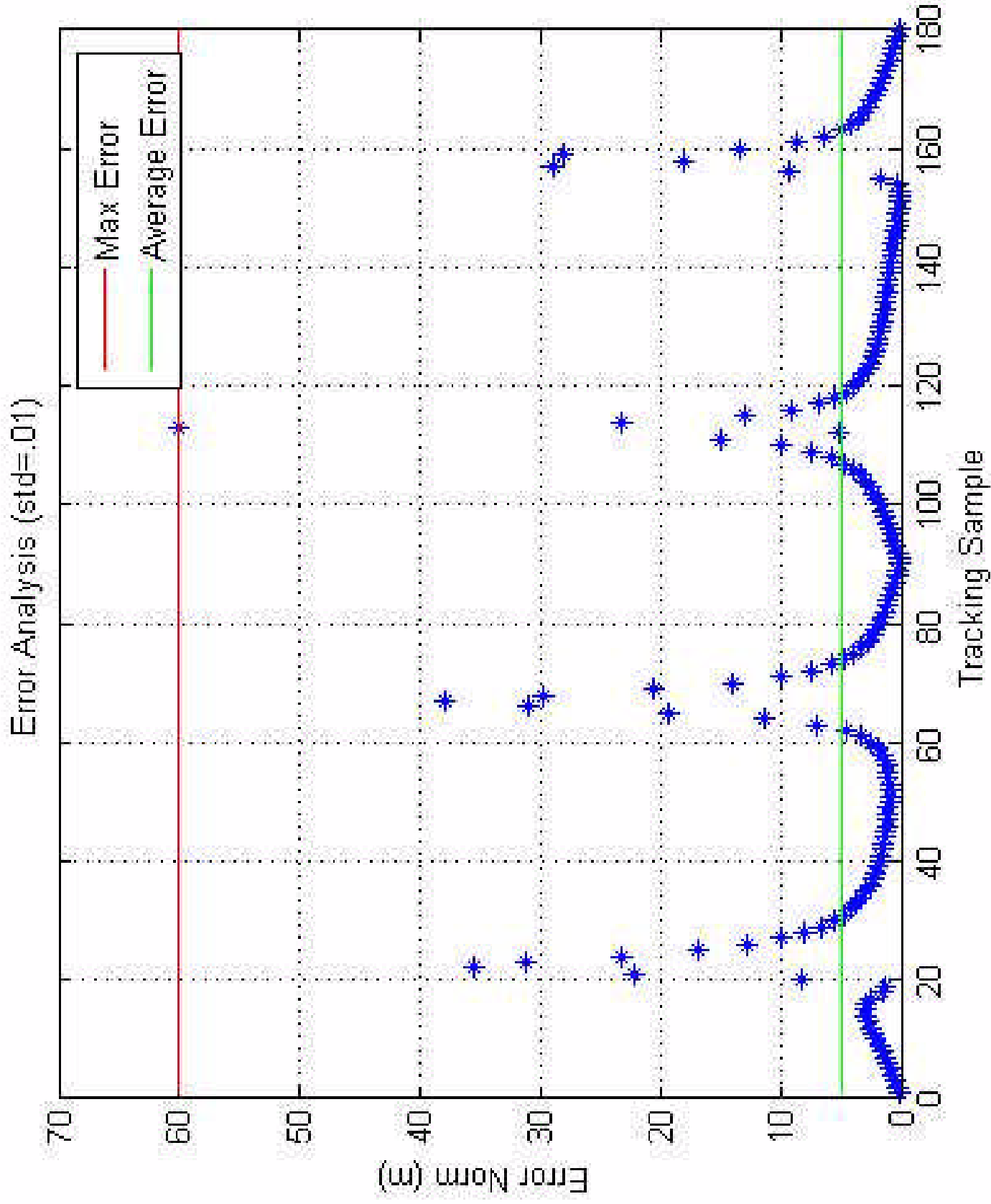
# Tracking Simulation Demo

## Orbit Tracking

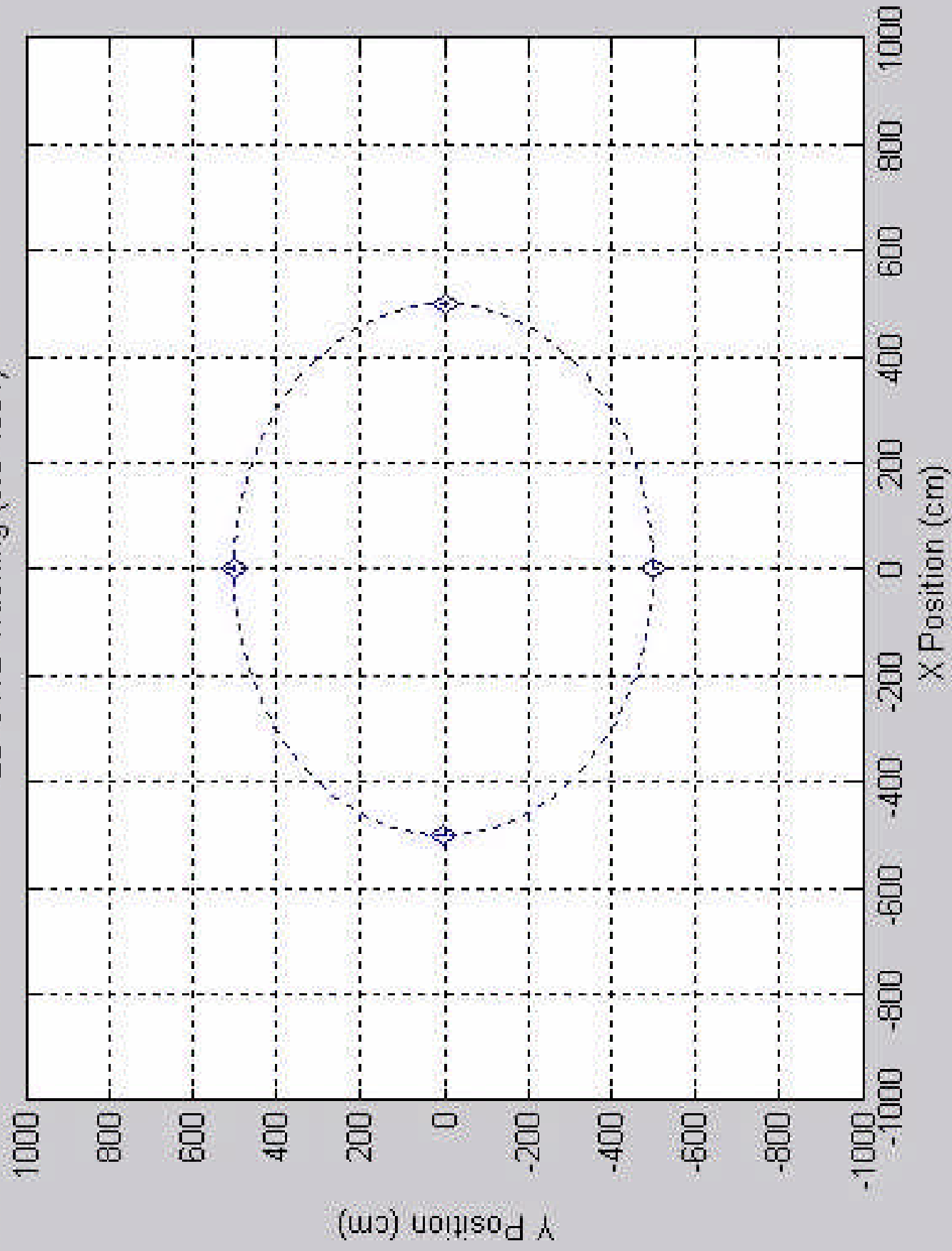
- Tracking Resolution vs. TDOA noise
- Tracking Resolution vs. Receiver Configuration
- Tracking Resolution vs. Dynamic Reference

2D UWVB Tracking (std=.01)

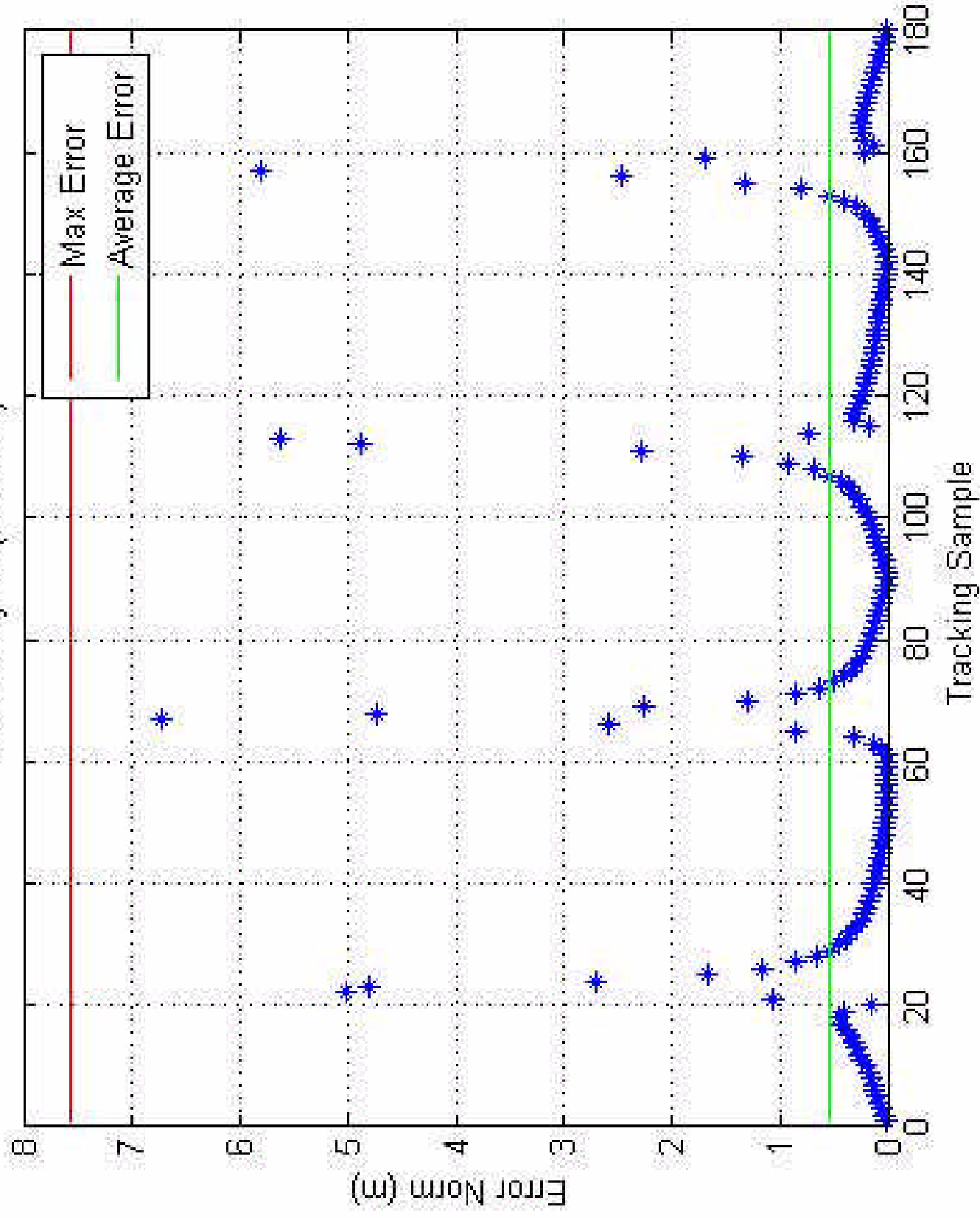




2D UWVB Tracking (std=.001)



Error Analysis (std=.001)



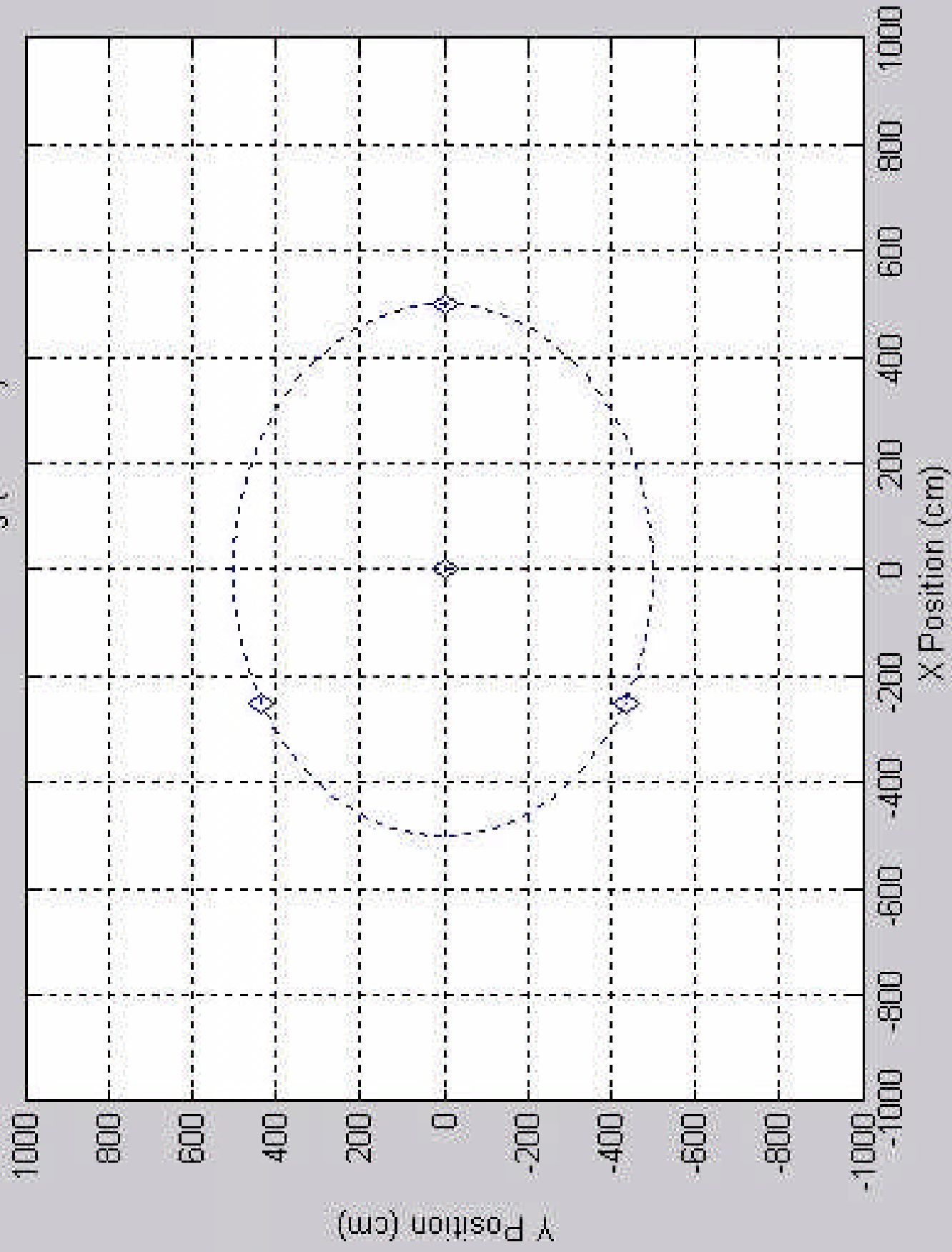


## Error Analysis

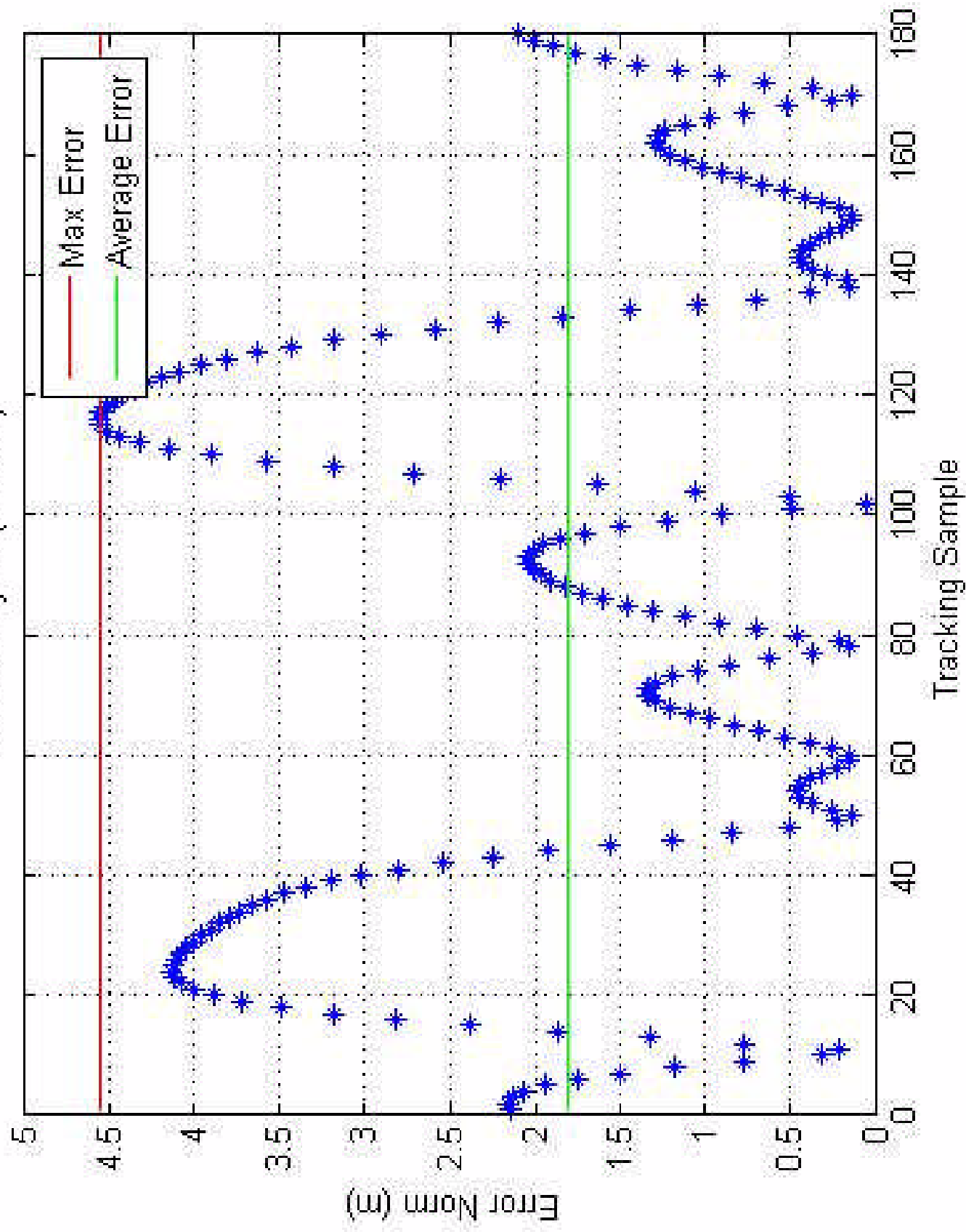
| Standard Deviation<br>of TDOA (ns) | Maximum Error (m) | Average Error (m) |
|------------------------------------|-------------------|-------------------|
| <b>0.01</b>                        | <b>60.0461</b>    | <b>4.9656</b>     |
| <b>0.001</b>                       | <b>7.5611</b>     | <b>0.5468</b>     |
| <b>0.0001</b>                      | <b>0.7218</b>     | <b>0.0544</b>     |

- The tracking error is linear to the standard deviation of TDOA data

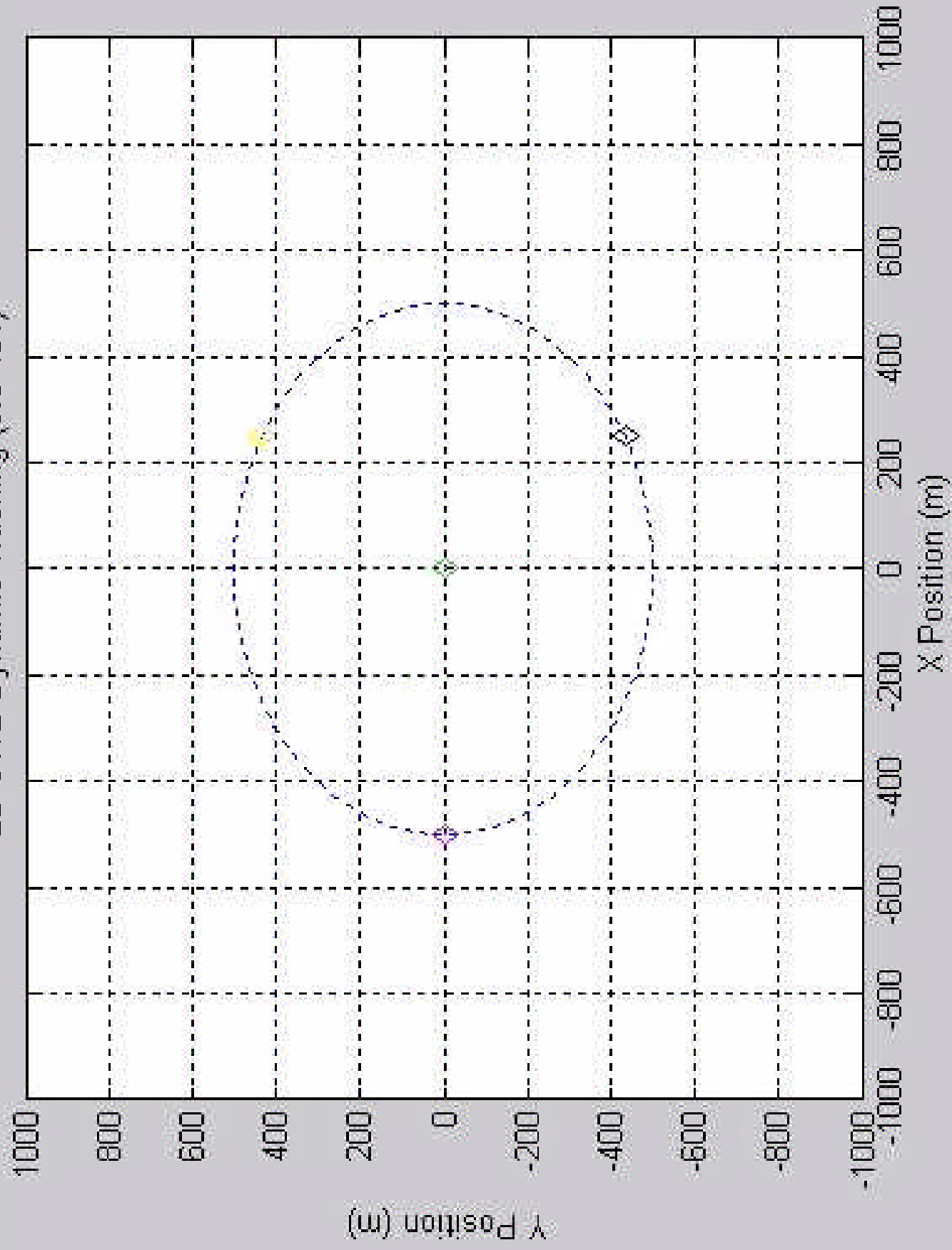
2D UWVB Tracking (std=.01)



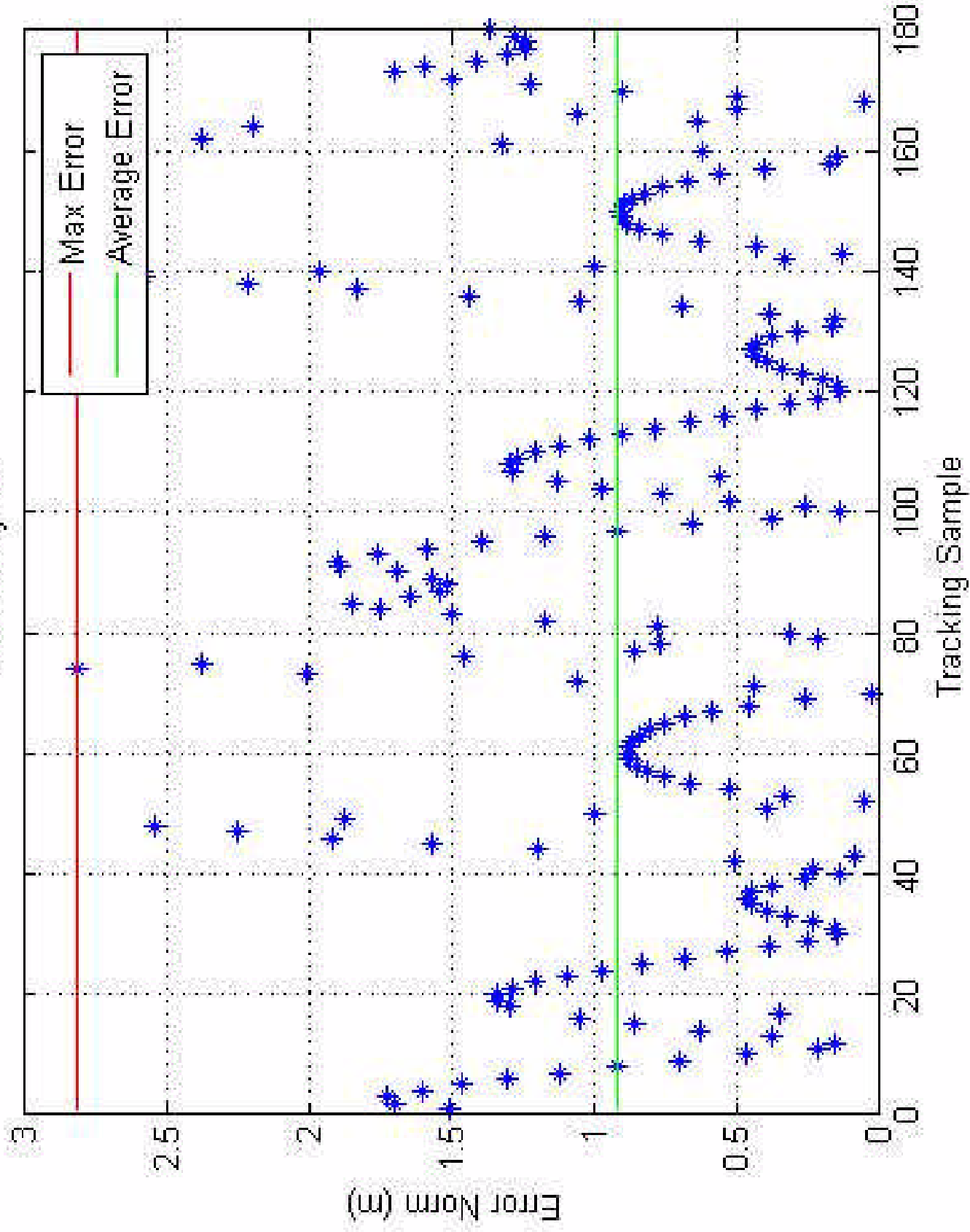
Error Analysis (std=.01)



2D UWVB Dynamic Tracking (std=.01)



# Error Analysis





# TDOA Summary

- TDOA algorithm can achieve fine tracking resolution with UWB fine time resolution
- Tracking resolution is proportional to TDOA noise level
- Receiver antenna configuration matters
- Dynamic reference can improve the tracking resolution



# Future Work

- AOA

To study the scalable baseline configuration to increase the tracking coverage

- TDOA

To improve the tracking resolution using enhanced algorithm (Totally Least Square Algorithm)

To study the optimal receiving antenna configuration

- AOA and TDOA

Extend the tracking dimension (from 2D<sup>38</sup> to 3D)